

# **ABS Data Compressing Kickoff Meeting - Status, Future Work, and Roadmap**

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## **ABSTARCT**

**ABS will produce unprecedented volume of information rich atmospheric and environmental remote sensing data. In this part 1 presentation we are reviewing the current progress/approach of data compression and noise estimate. The future work to achieve both ground-based and on-board ABS data compression needs are also conversed. A roadmap designed to cover the end-to-end study needs is outlined as well.**



# Outlines

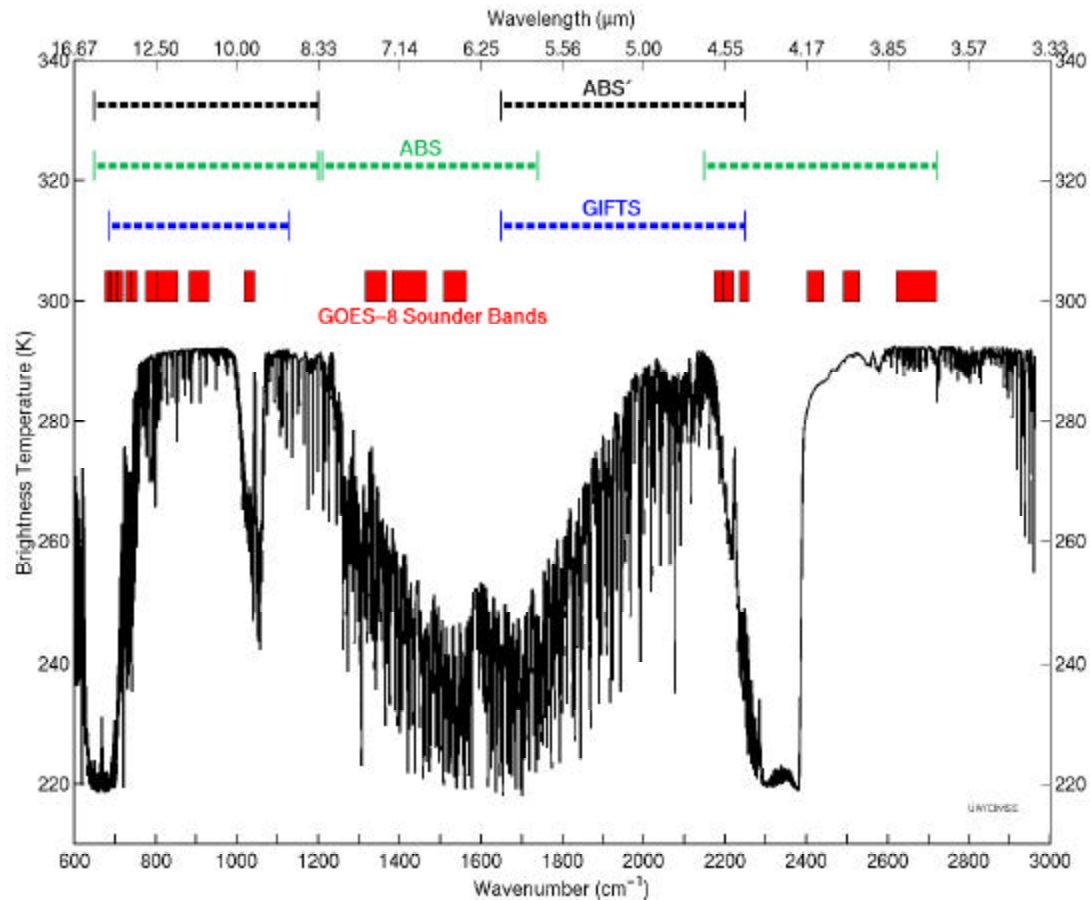
- Hyperspectral Data Information/Background
  - Data Volume; spectral, temporal, and gradient Inf. Con.
- GIFTS/NAST-I/AIRS data Compression Study Status
  - Will be discussed in details this afternoon
- Proposed Data Compression Approaches
  - Ground Based & On-board
  - Noise Estimation
- Roadmap for ABS Data compressing
  - Measurement Simulation, Data Compression Study, Defined Requirements, and Recommend Solution



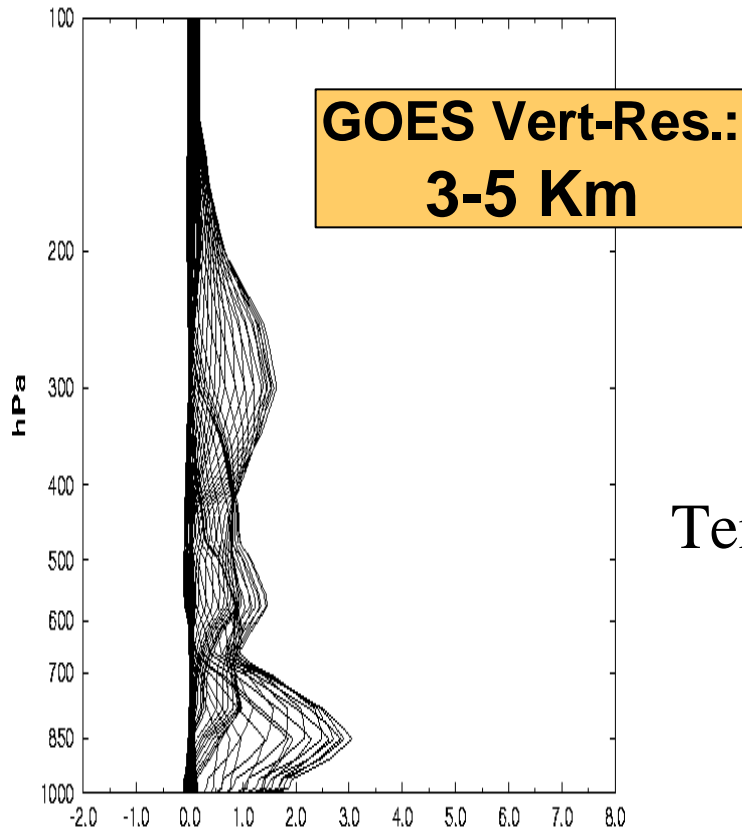
# ABS Hyperspectral IR Data -

What to Expect -> **Lots more data than we can handle**

ABS/GIFTS ~ 3000 ch. per IFOV

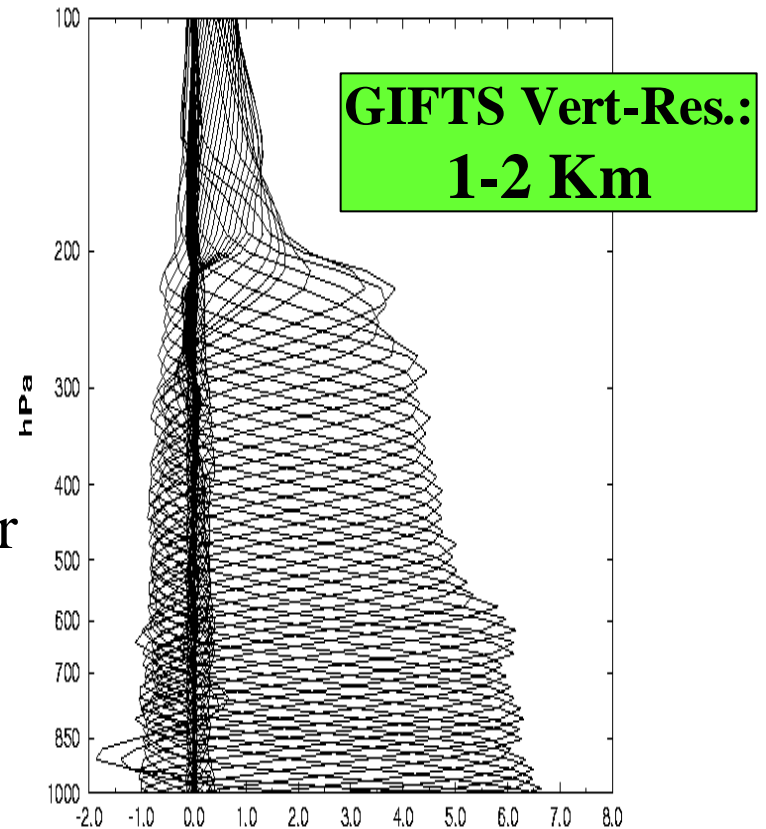


# Hyperspectral Data Information - Spectral Information -> Vertical Resolution



**Current - GOES**

**~3 Pieces**



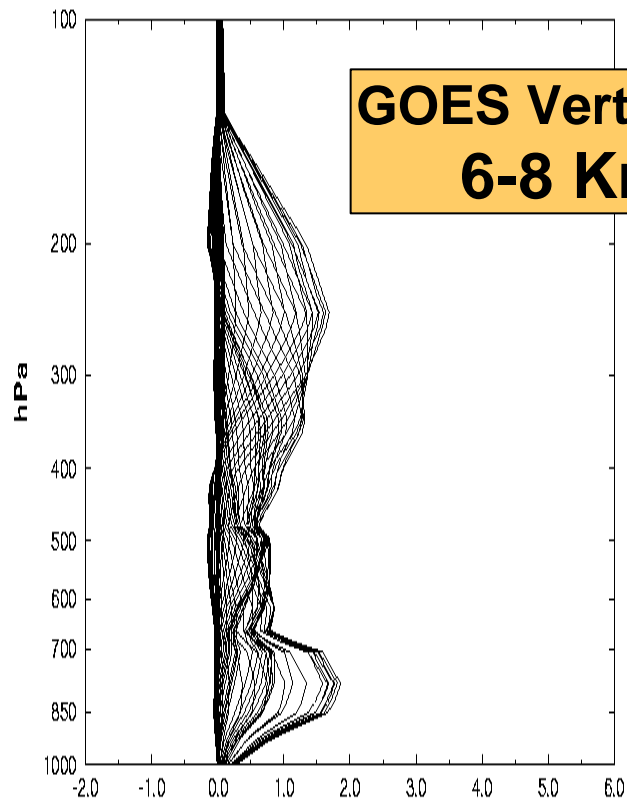
**GIFTS**

**10-12 Pieces**

Temperatur

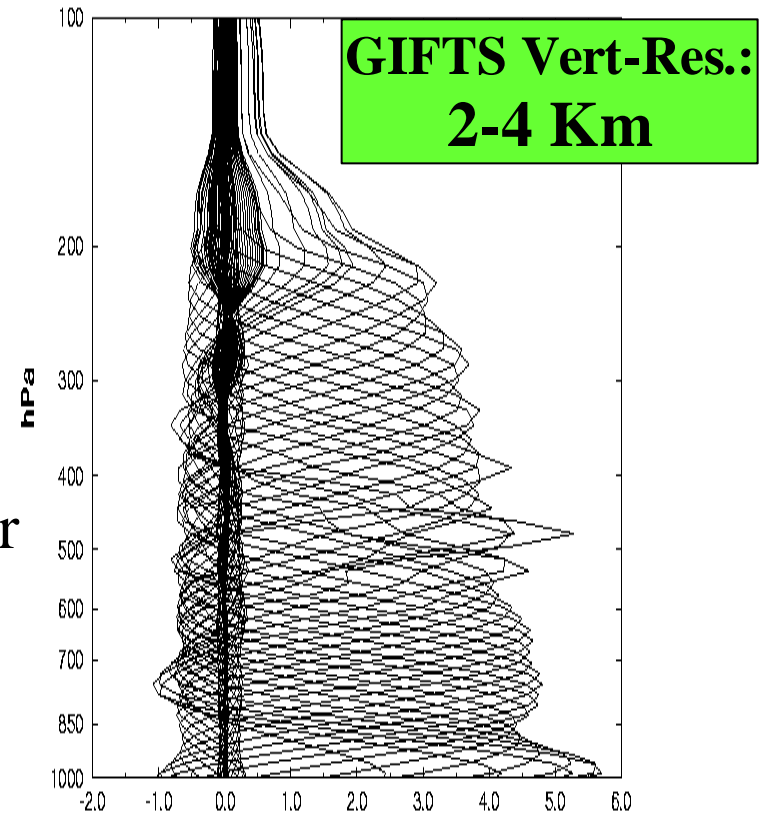


# Hyperspectral Data Information - Spectral Information -> Vertical Resolution



**Current - GOES**

**~2 Pieces**



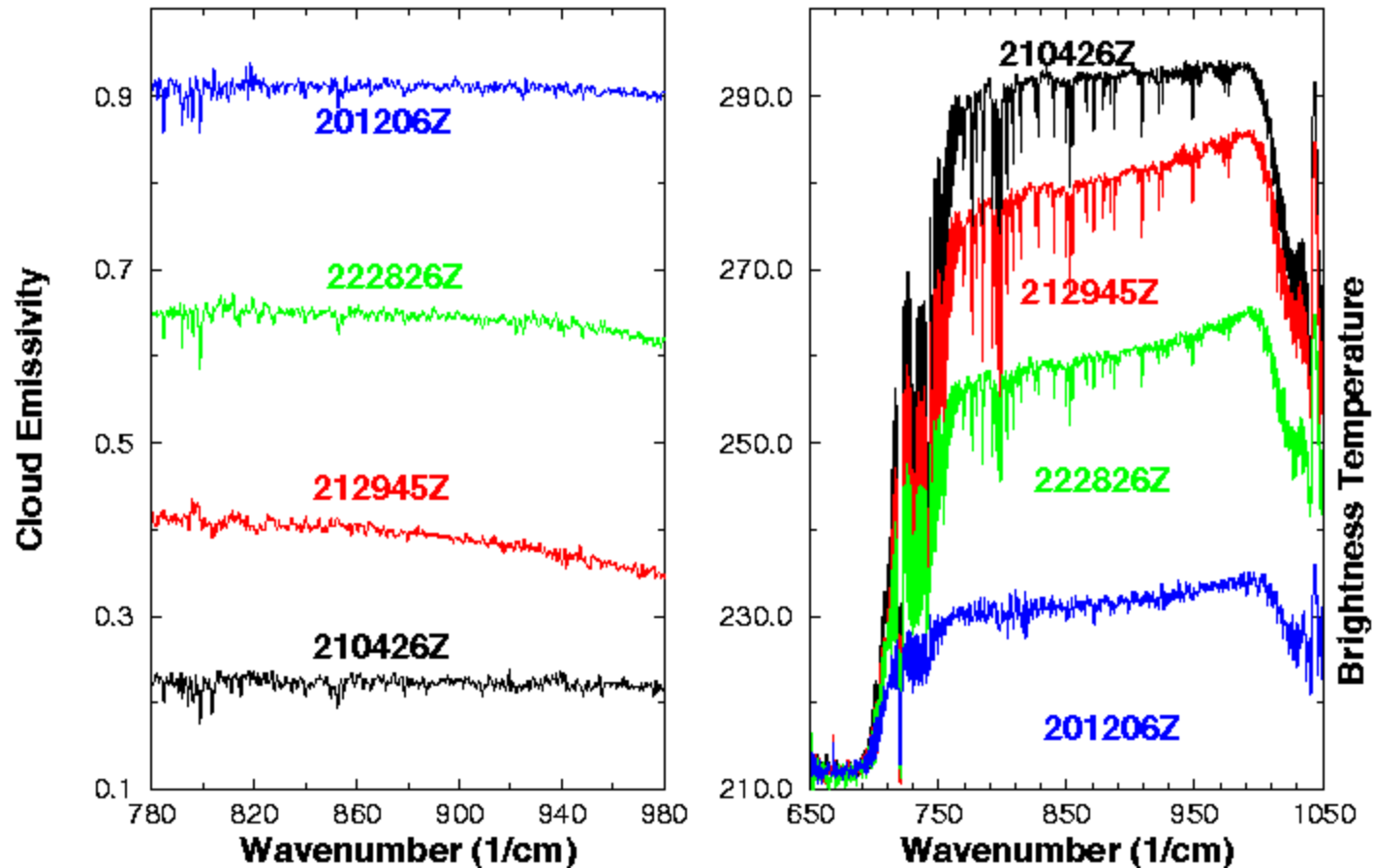
**GIFTS**

**8-9 Pieces**

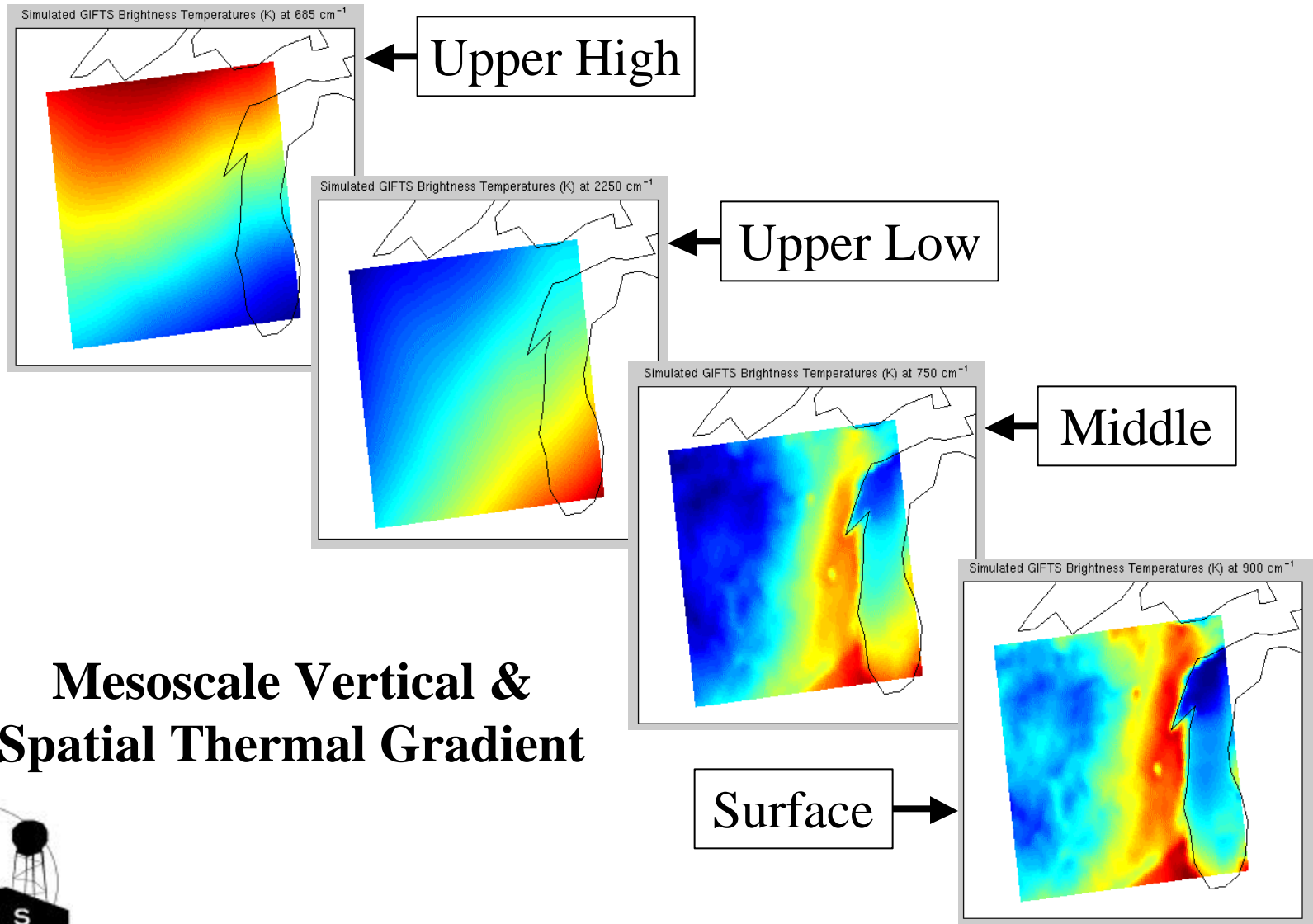
Water Vapor



# Hyperspectral Data Information - Spectral Information -> Marco & Micro Cloud Property

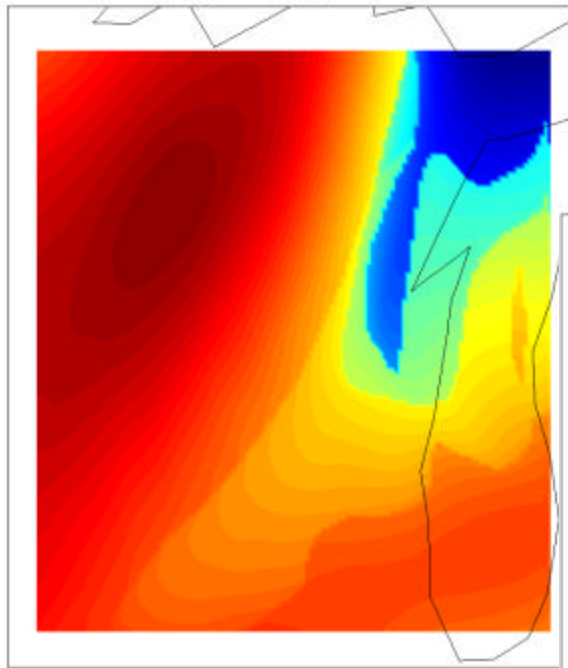


# Hyperspectral Data Information - Spatial Information -> **Gradient**



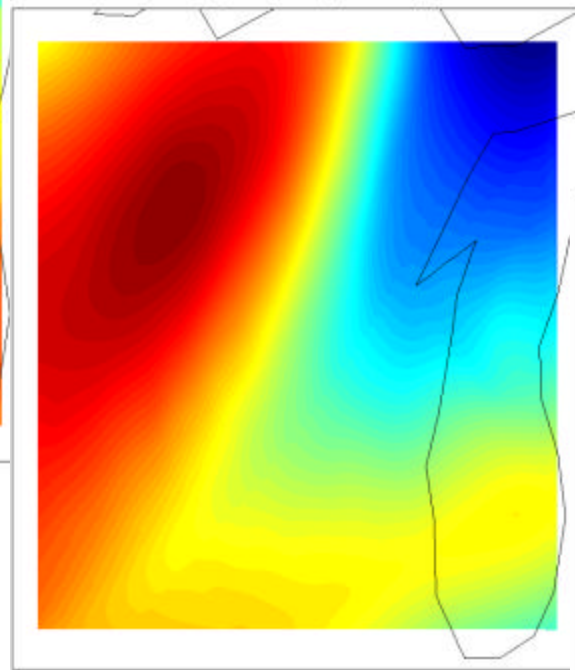
# Hyperspectral Data Information - Temporal Information -> **Moisture Transport**

Simulated GIFTS Brightness Temperatures (K) at  $1650\text{ cm}^{-1}$



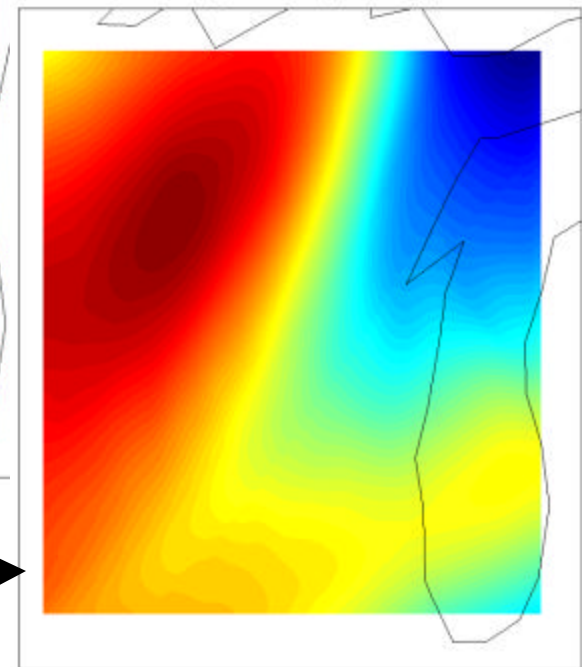
← 00:00Z

Simulated GIFTS Brightness Temperatures (K) at  $1650\text{ cm}^{-1}$



← 00:30Z

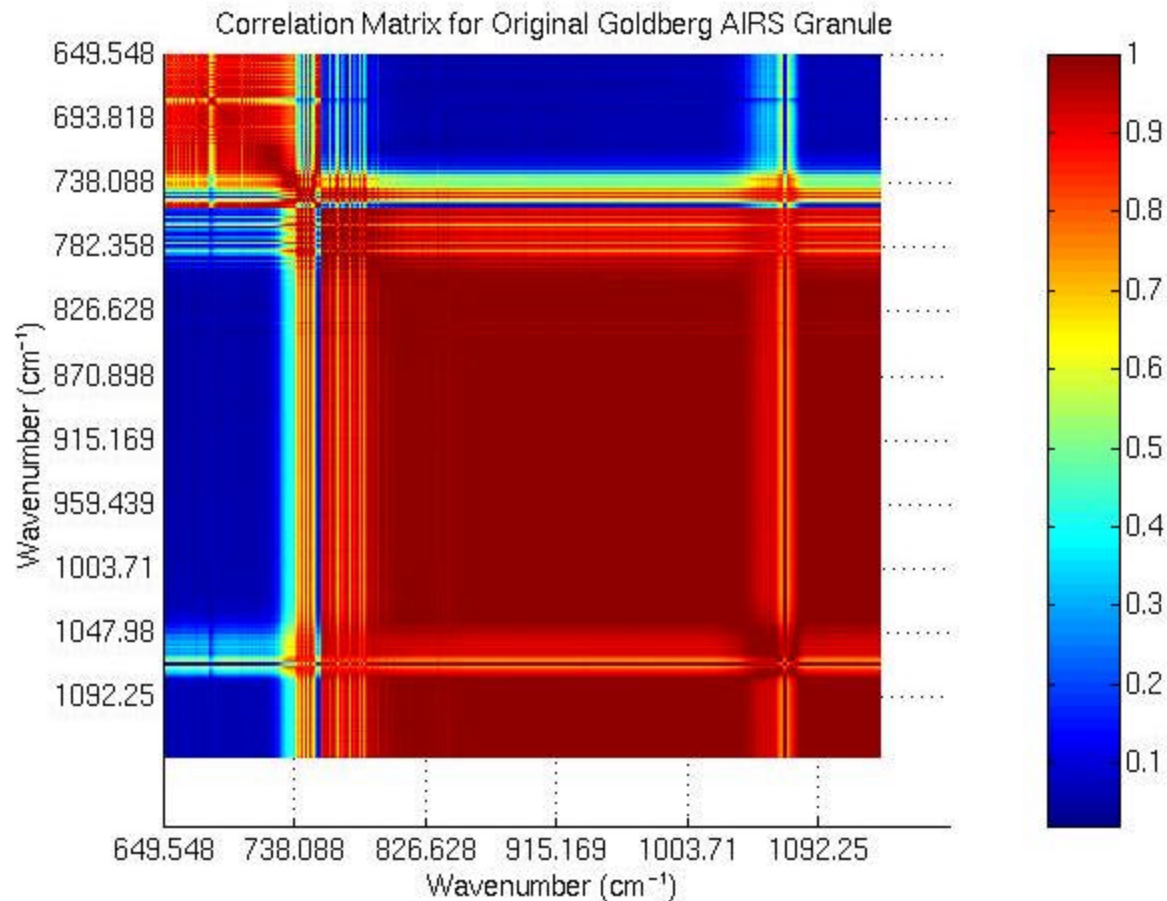
Simulated GIFTS Brightness Temperatures (K) at  $1650\text{ cm}^{-1}$



01:00Z →



# Hyperspectral Data Information - Spectral Correlation -> Data Redundancy?

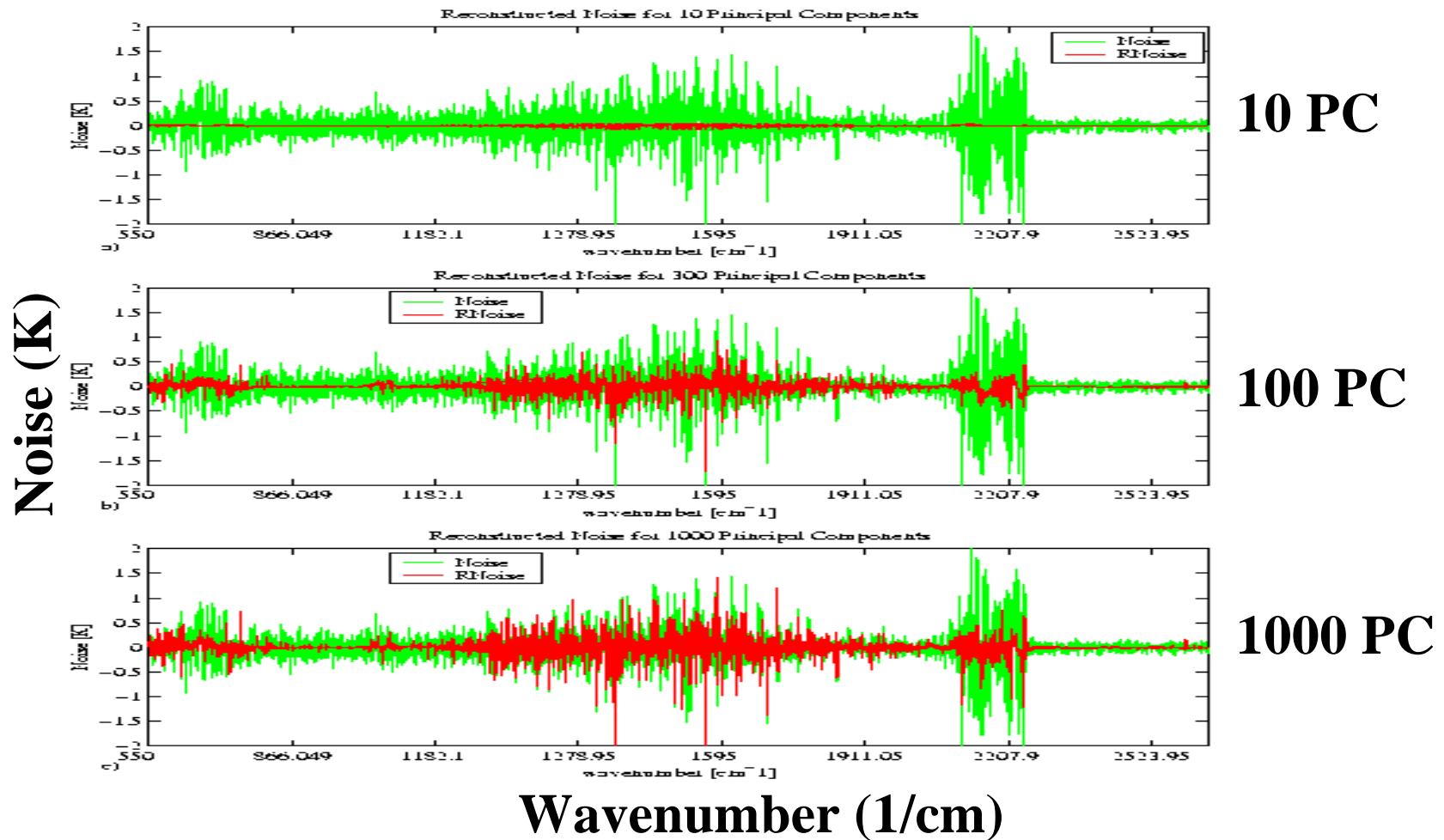


# What is PCA?

- PCA is Principal Component Analysis, a classical approach to the problem of linear (independent) feature extraction
- PCA essentially performs Singular Value Decomposition of the Covariance Matrix
- For **Gaussianly** distributed input, PCA extracts statistically independent features

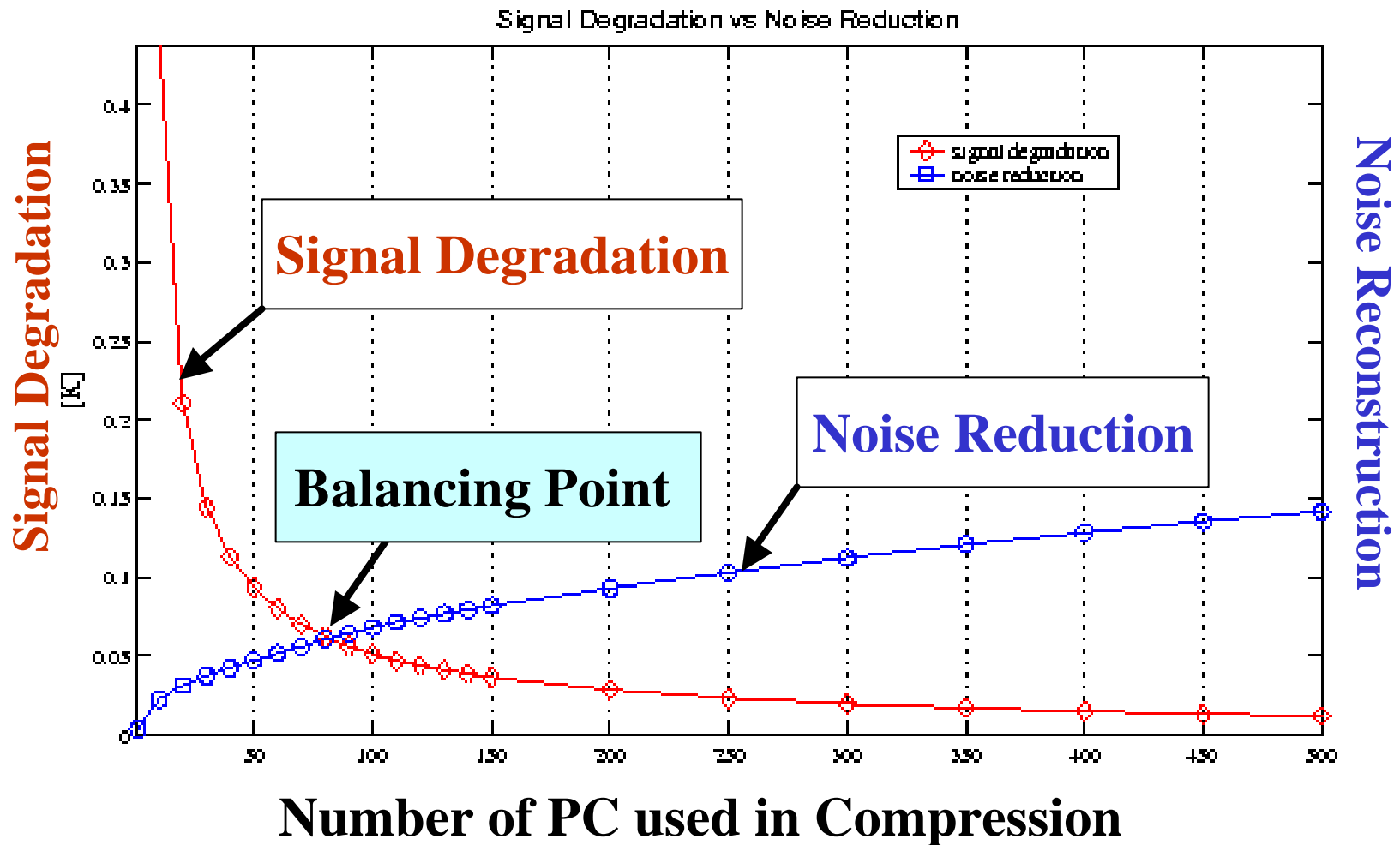


# Why Principal Component Compression (PCC) - Reason I : Noise Reduction

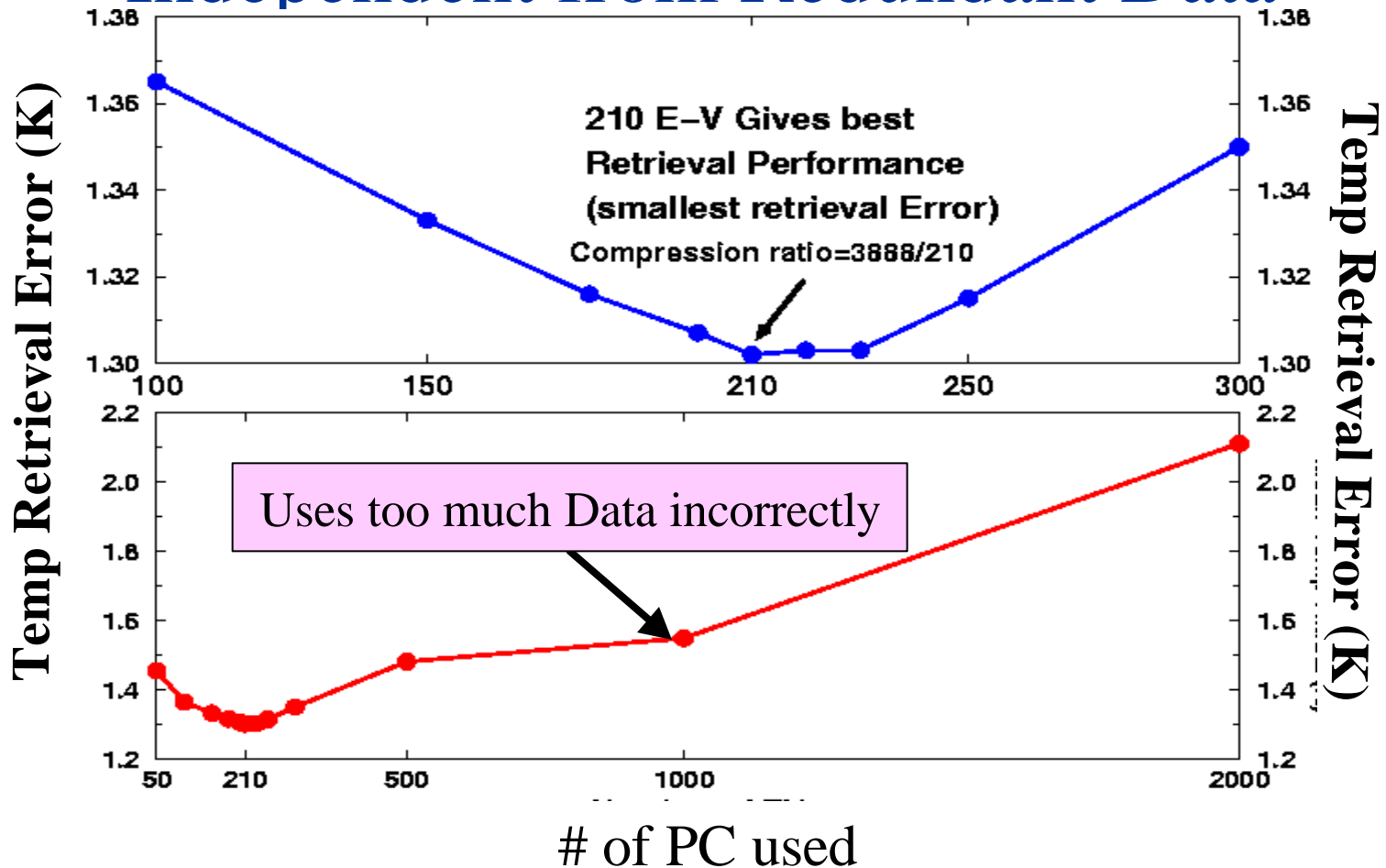


Green-Single Noise Spectrum Red-PCC Noise Spectrum

# Why PCC - Reason II : Tunable Signal Loss



# Why PCC - Reason III : Discriminate Independent from Redundant Data



**Uses of independent information only will  
improve retrieval performance**

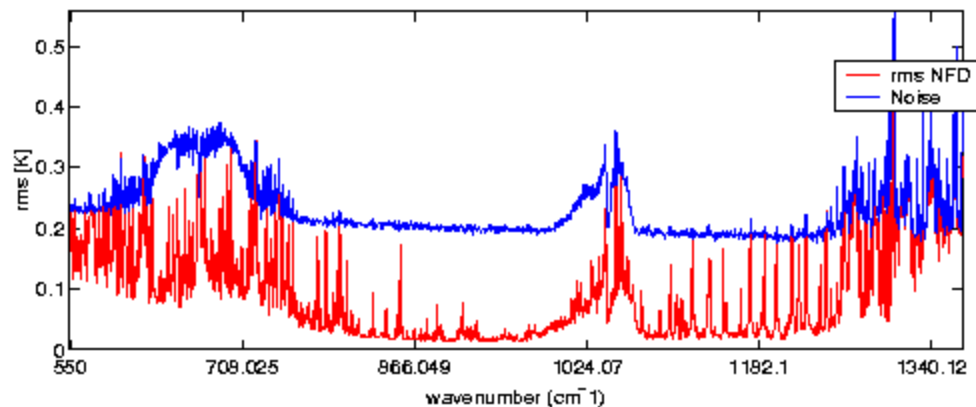
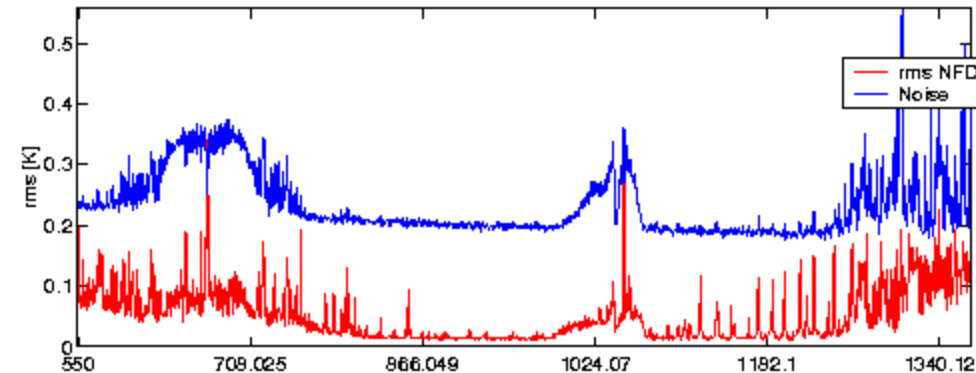
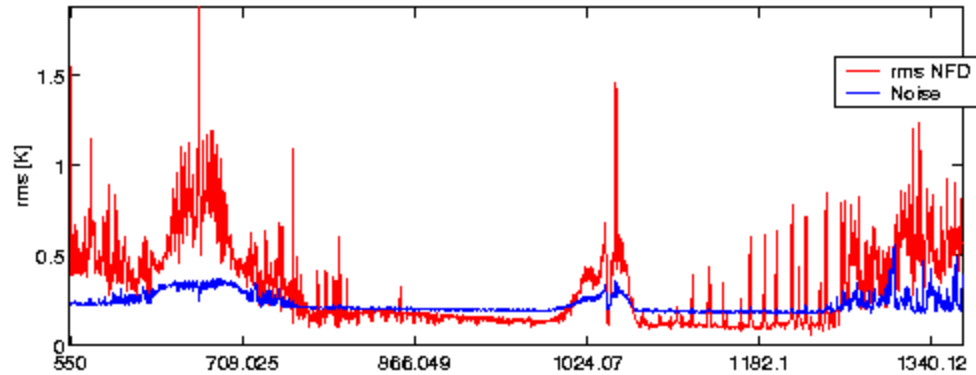
# Why PCC - Reason IV : Consolidate

## Measurement Information ( $\sim 2000$ to $\sim 100$ )

Blue - Noise

Red - PCC Residual

Residual (K)



Residual < Noise

# Principal Component Compression (PCC)

## Pros & Cons

### **Cons:**

- 1. Requires PCA (Significant Computational Costs)**
- 2. Requires Measurement Reconstruction**
- 3. Representative Set Selection for PCs is an issue**

### **Pros:**

- 1. Noise Reduction/Estimation**
- 2. Tunable Signal Loss**
- 3. Discriminate Independent from Redundant Data**
- 4. Increase Information Density**
- 5. Intermediate Retrieval Processing step**
- 6. Suitability to Available Computing Systems**

# Hyperspectral Data Processing -

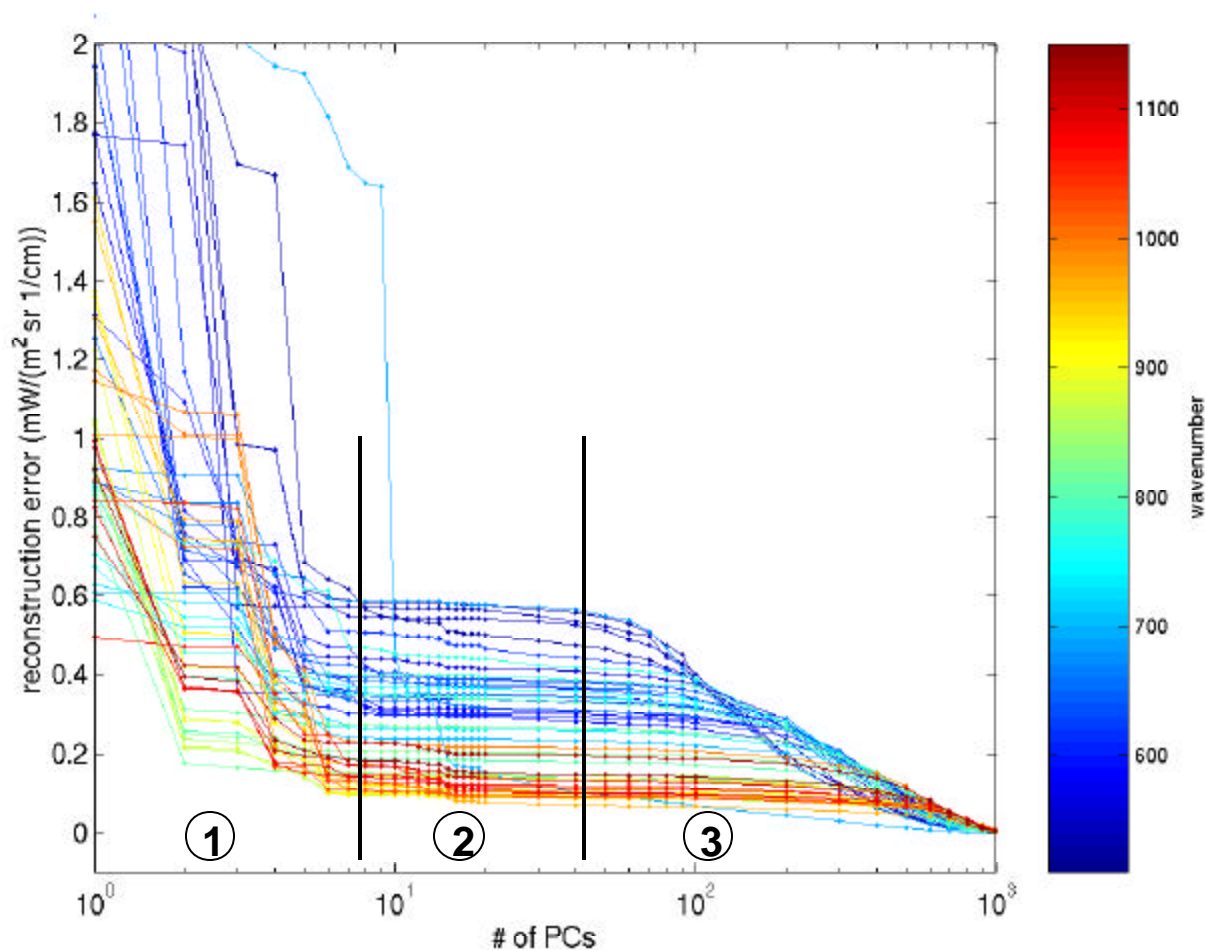
## Why can we Estimate Noise Effectively ->

### Signal & Noise are Estimated Separately

1 - Signal under represented

2 - Signal well represented; Noise filtered

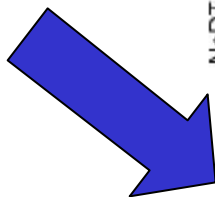
3 - Signal & noise both duplicated



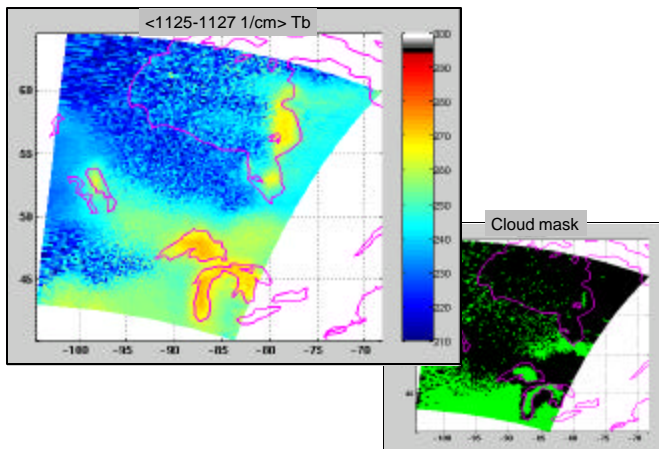


# Hyperspectral Data Processing - Why can we Estimate Noise Effectively -> Noise are Well Estimated

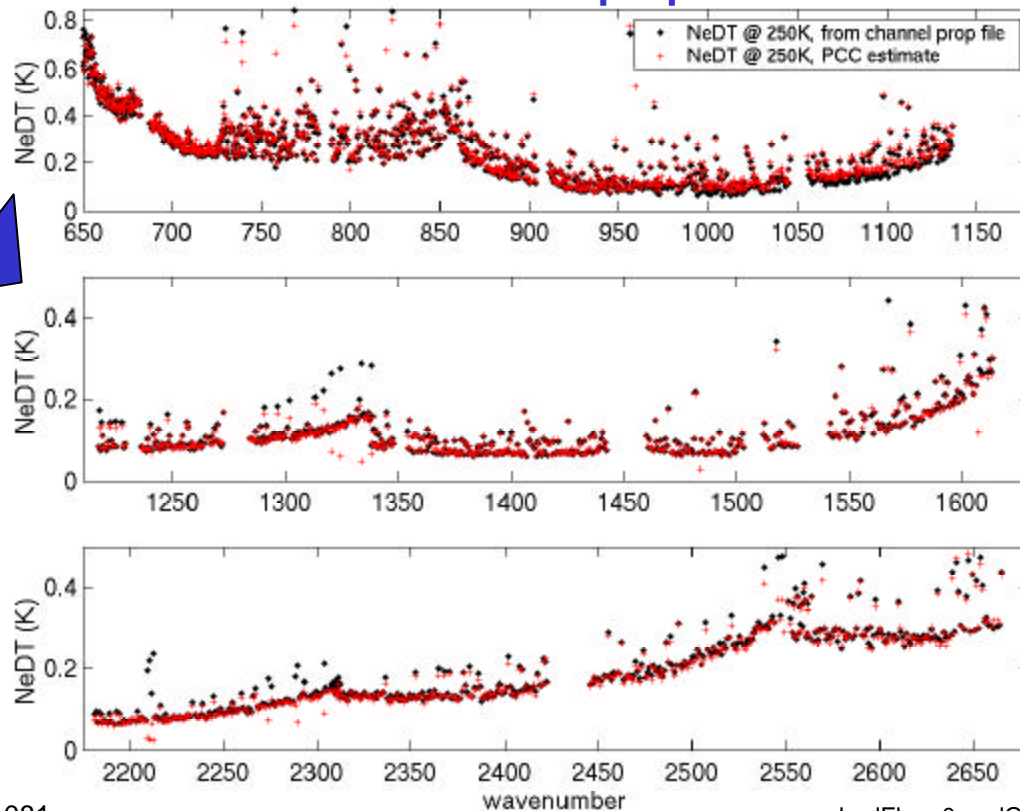
Noise estimated  
well represent  
actual  
measurement  
noise



15-Dec-2000 granule 081



NeDT@250K: estimated from granule 081 and  
values from channel properties file



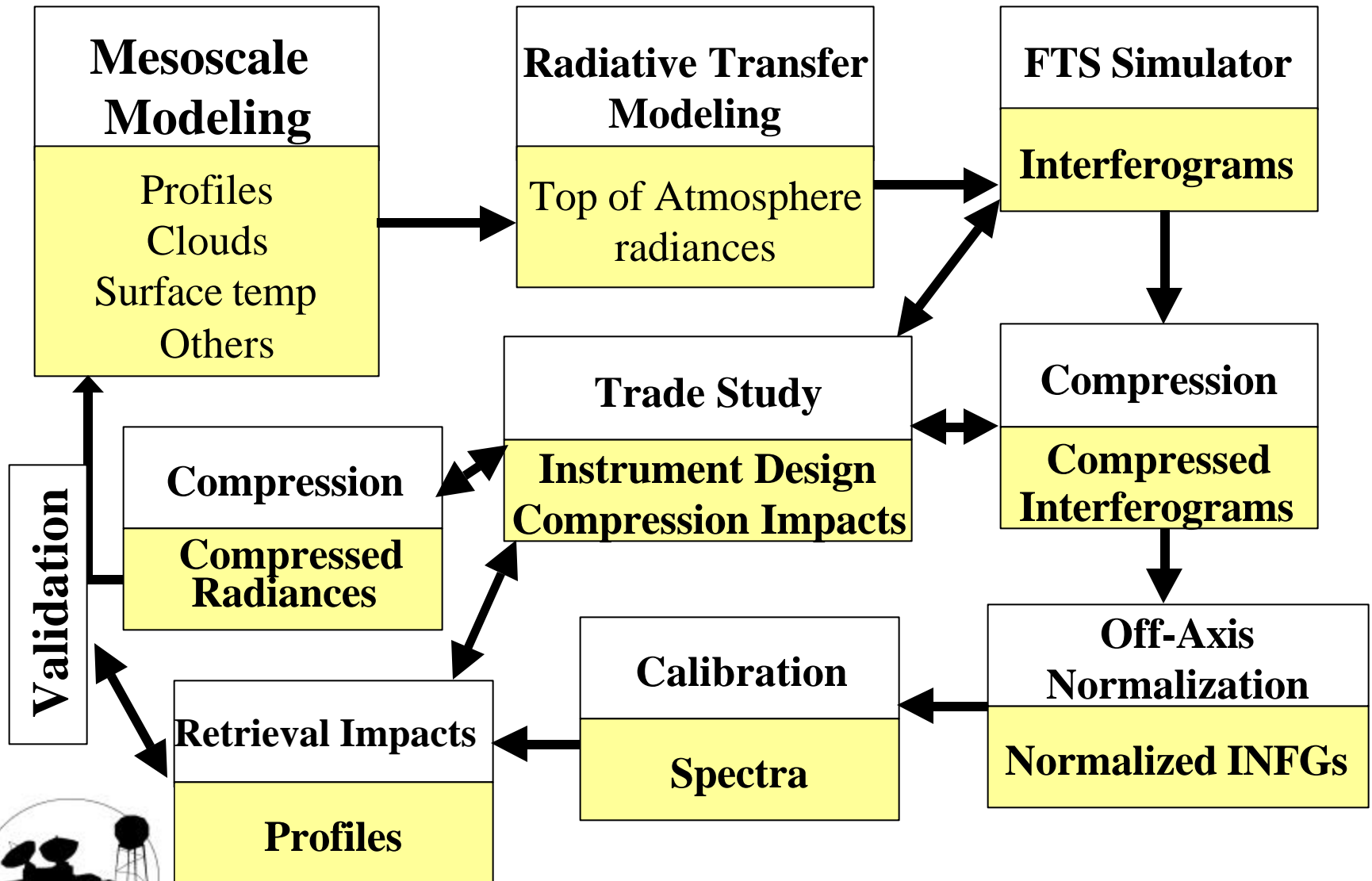
081

badFlag=0, radQual



# ABS Measurement Simulation and Data Compression

## - Top Level Flow Diagram



# ABS FTS Simulation

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Input Calculated Top of Atmosphere Spectra



- Add Instrument Background
- Apply Instrument Responsivity
- Apply Numerical Filter
- Apply Instrument Line Shape Function
- Apply Off-axis Interferogram Sampling



Output ABS Interferograms or Spectra



# ABS Measurement Noise Simulation

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Input ABS ???



- Apply ??
- Apply ??
- Apply ??
- Apply ??
- Apply ??

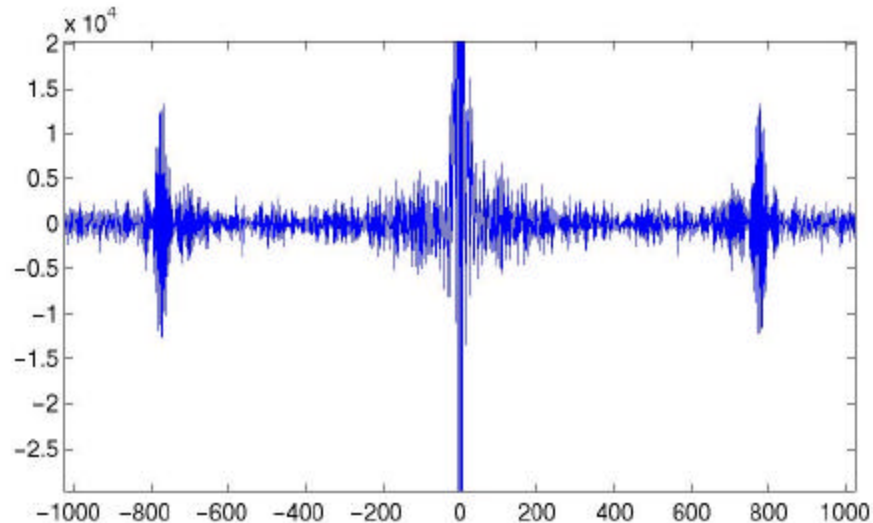


Output ABS Noise Spectra

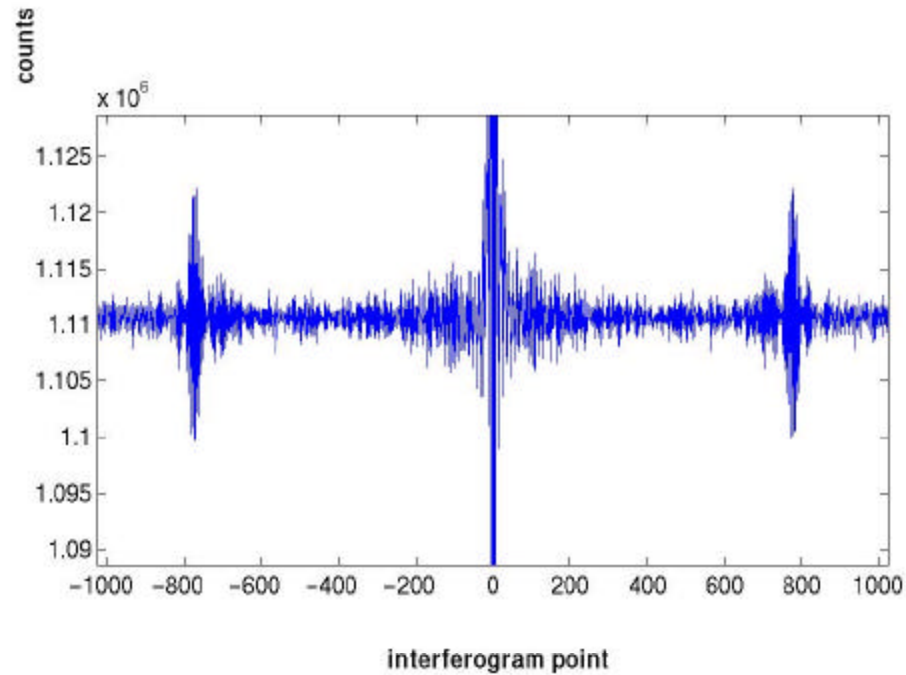


# Example LW Interferogram with variable Gain and Offset

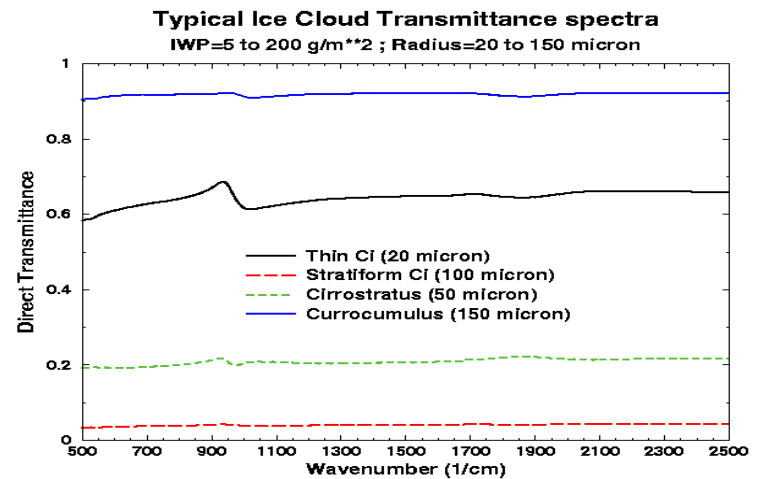
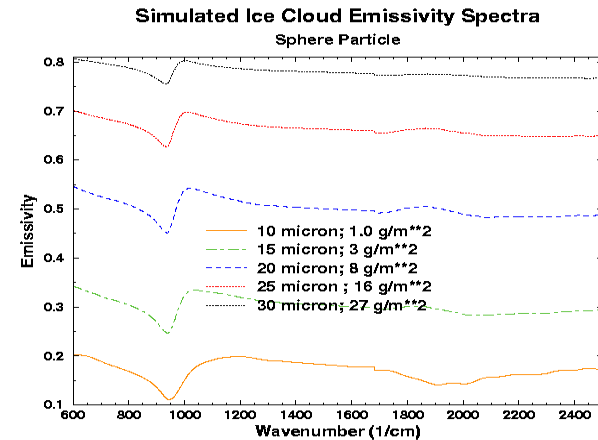
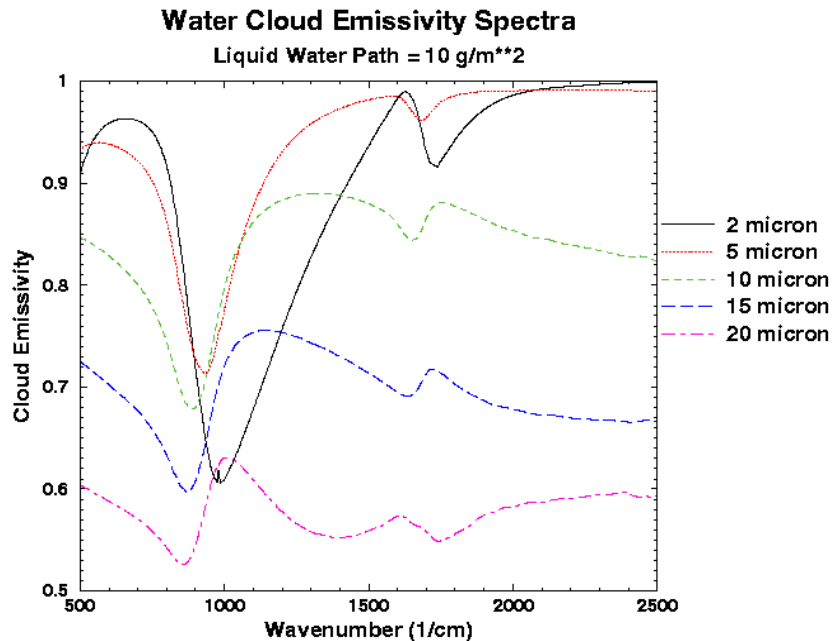
without effects



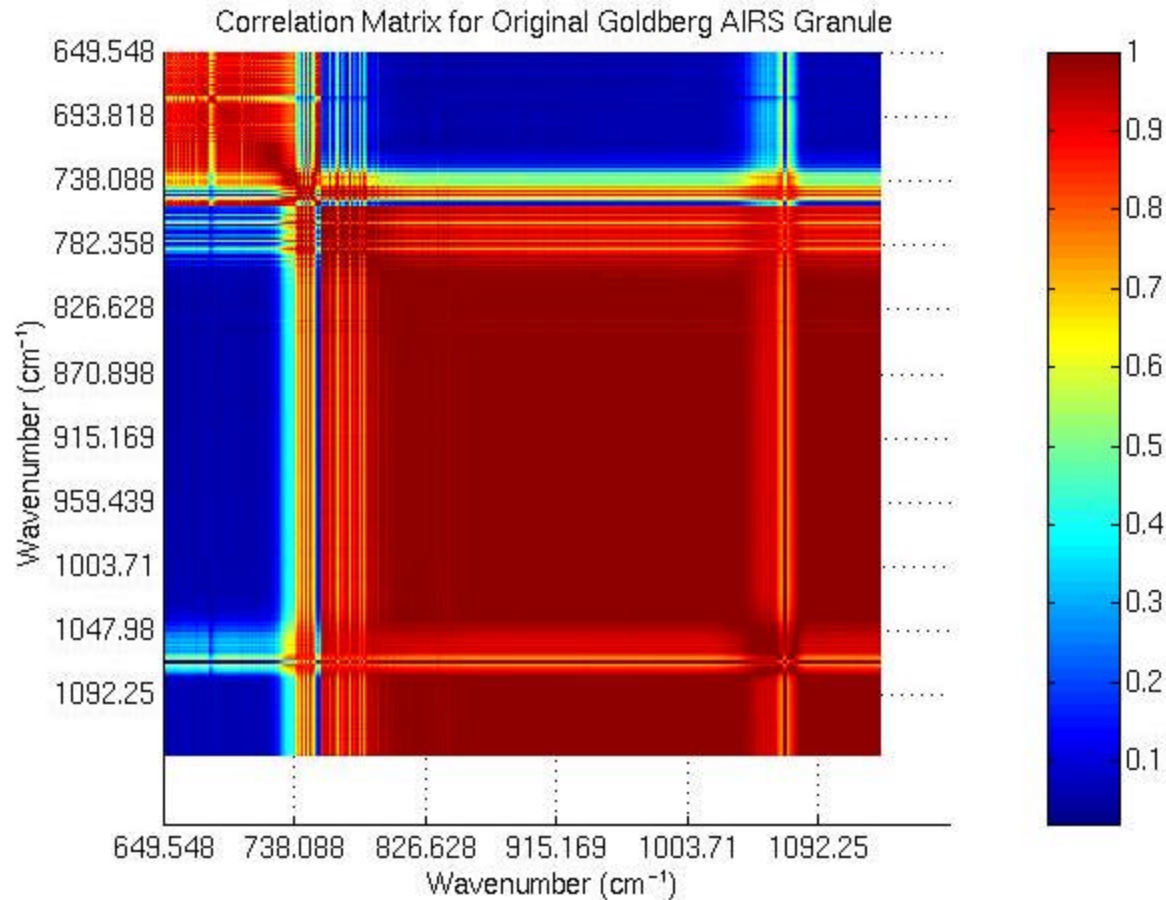
with effects



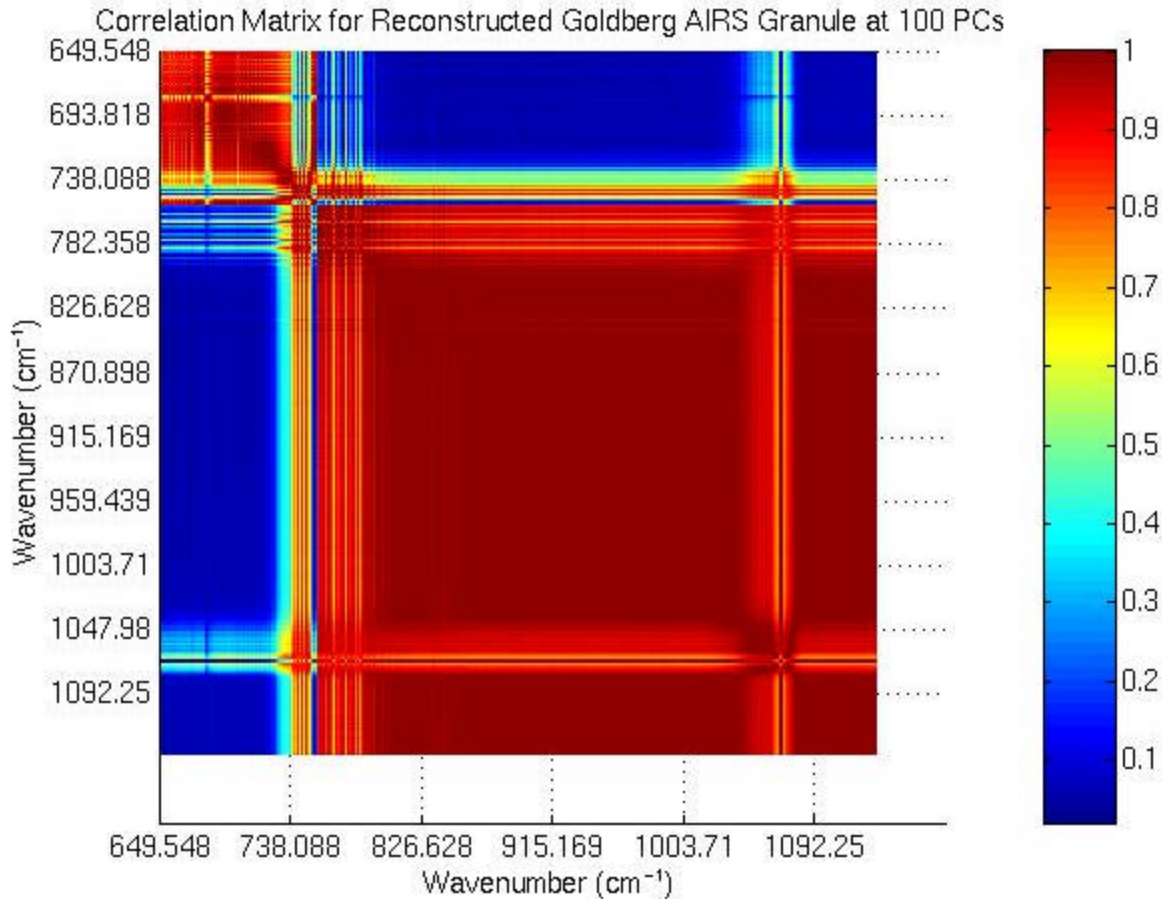
# Parameterization of Ice and Liquid Cloud



# Raw Data Spectral Correlation

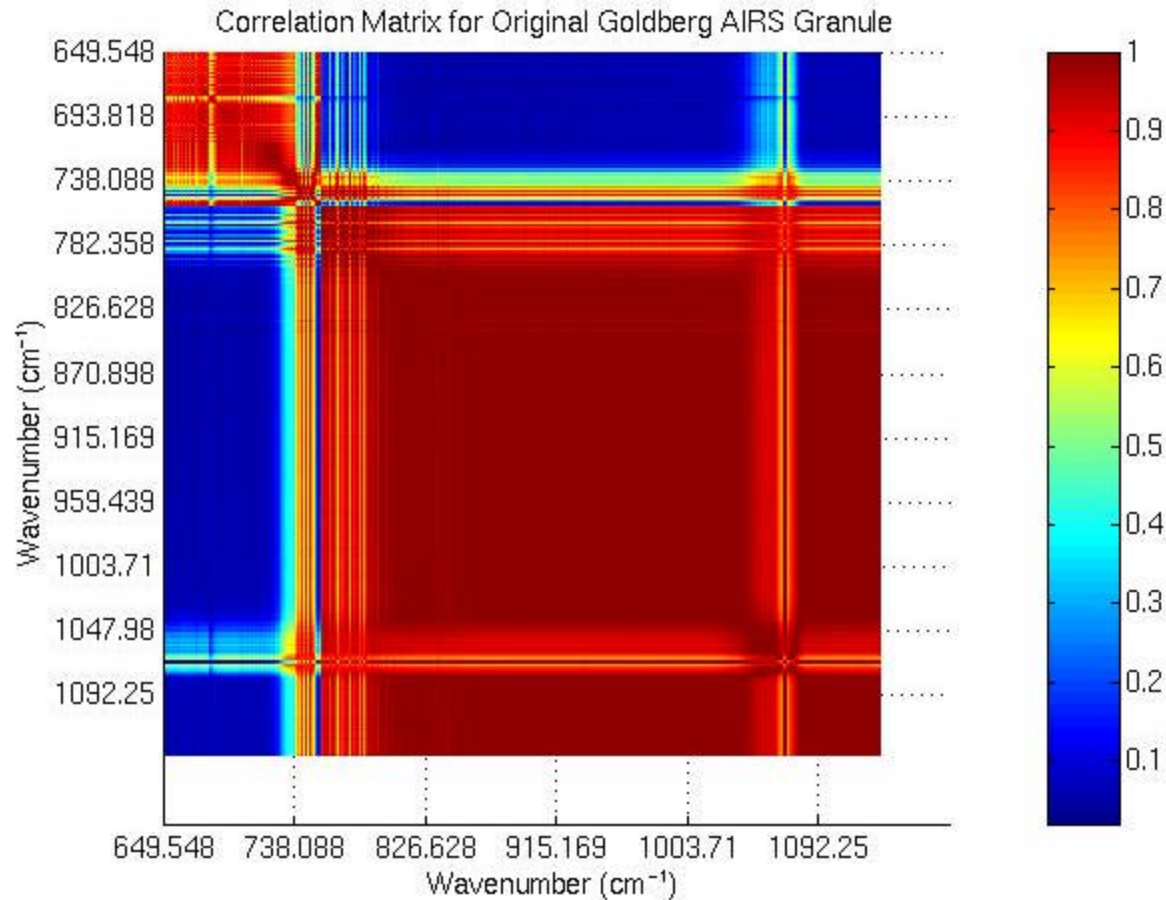


# 100 PC Compressed Data Spectral Correlation

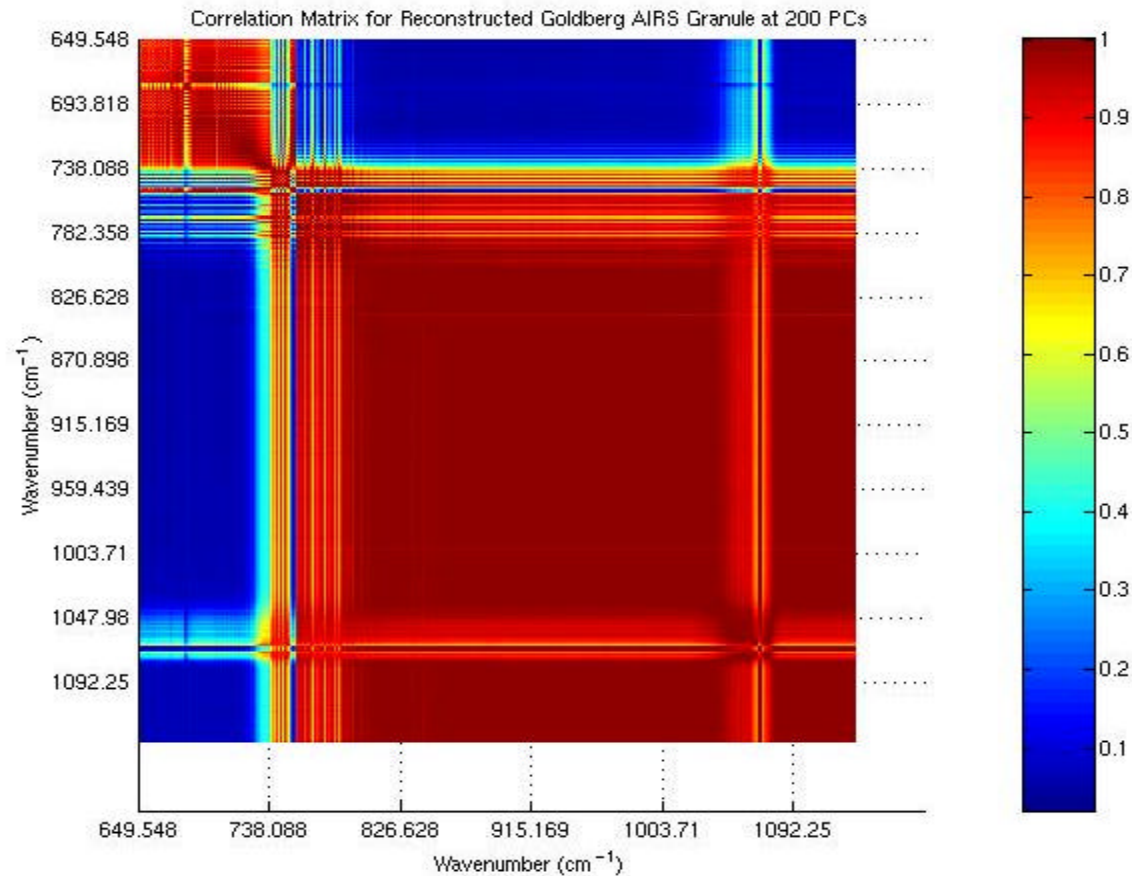




# Raw Data Spectral Correlation

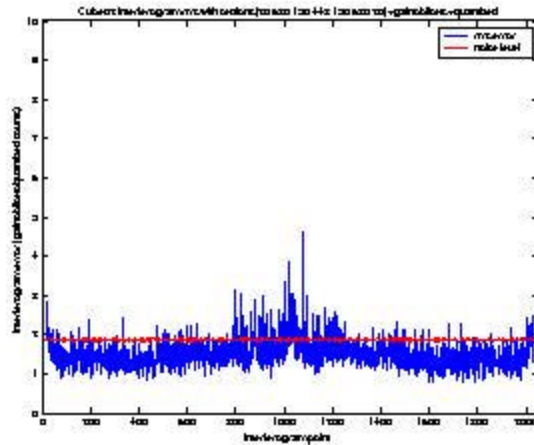


# 200 PC Compressed Data Spectral Correlation

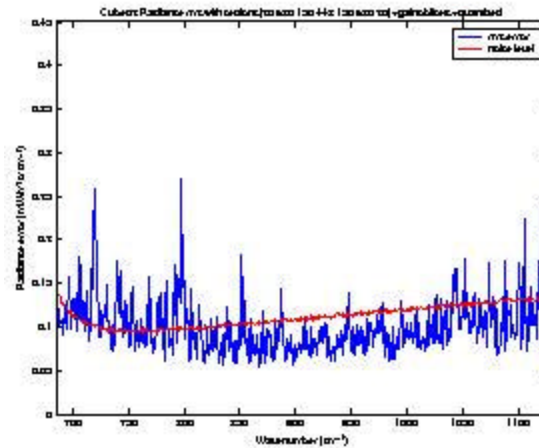


# Compression Residuals - Raw or Calibrated Domains

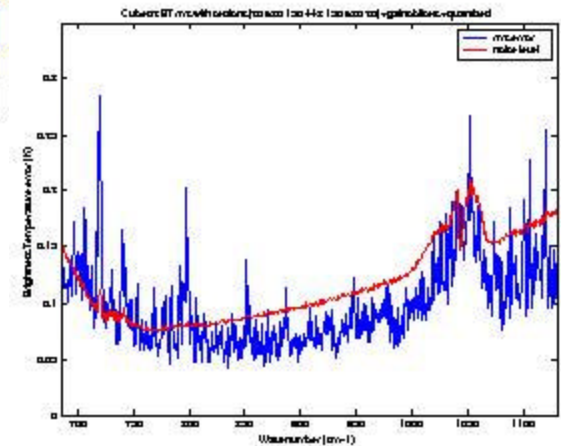
## Interferogram



## Radiance



## Brightness Temp.



# Definitions

**Old DPC:** Old Dependent Principal Component  
(fixed point segments)

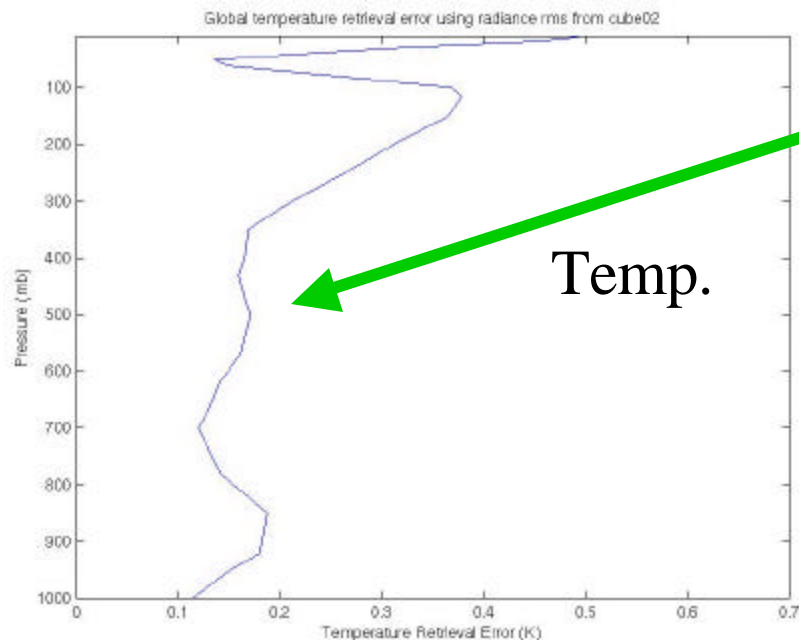
**New DPC:** New Dependent Principal Component  
(Variable point segments)

**New HPC:** New Hybrid Dependent & Independent Principal Component (Variable point segments and PCs are derived from on-line dependent and off-line independent historical/pre-computed data)

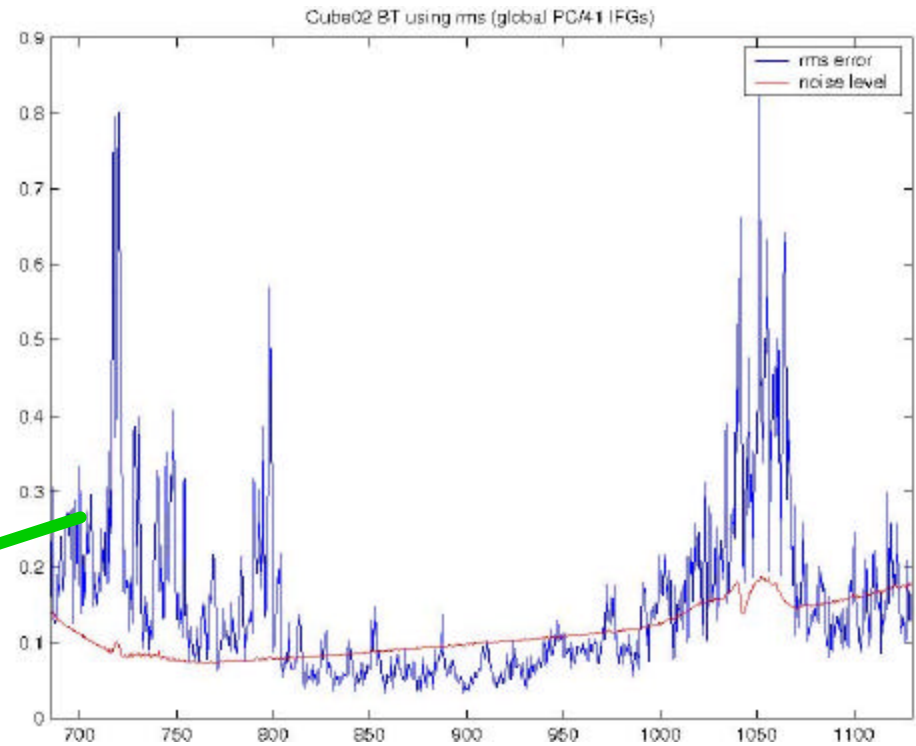
Note: 1. New DPC achieves better compression than old DPC  
2. New HPC requires much less on-board processing than New DPC but degrades compression performance



# HPC Compression Impact on Retrieval - Cube 2

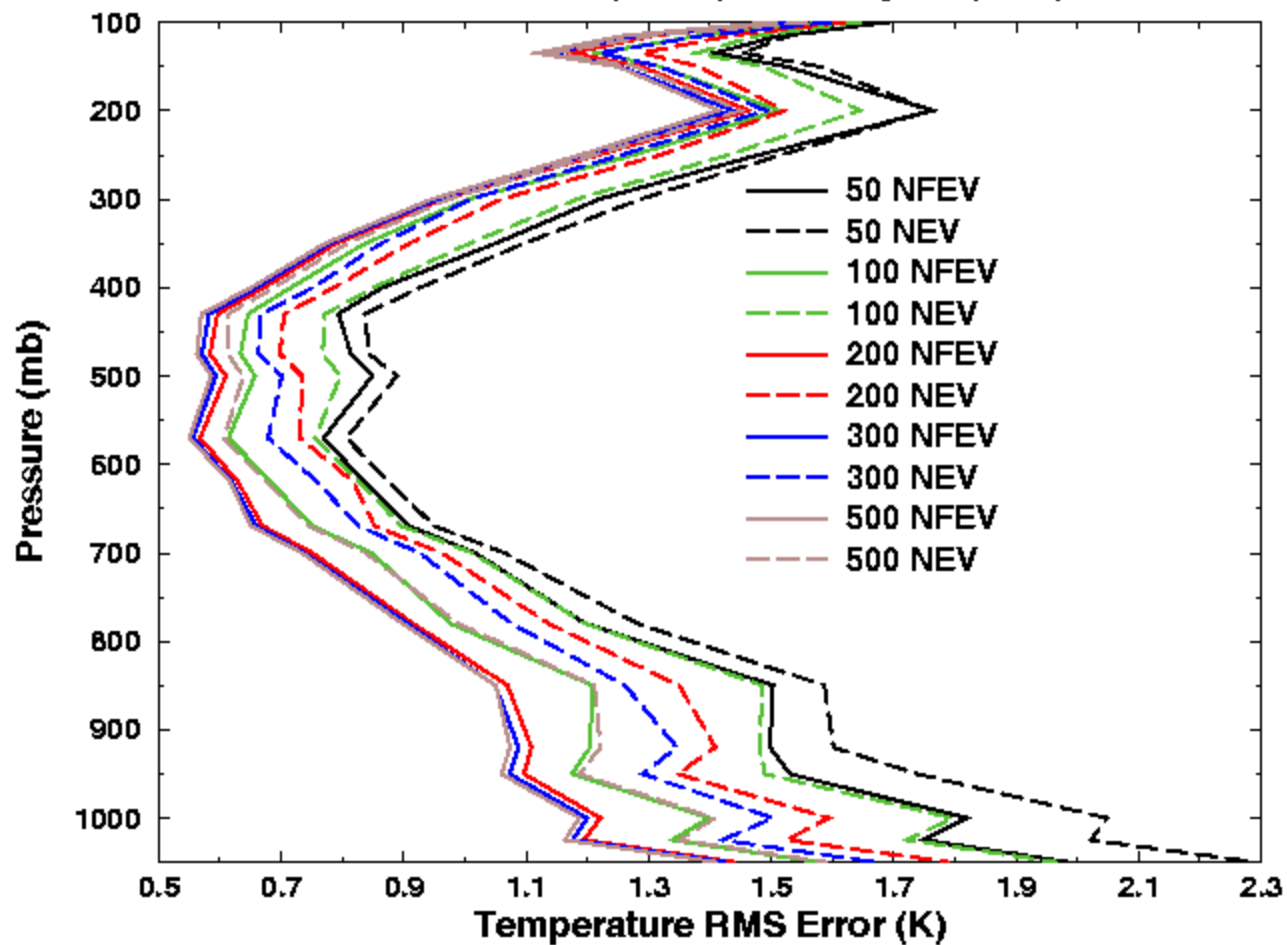


Temp.



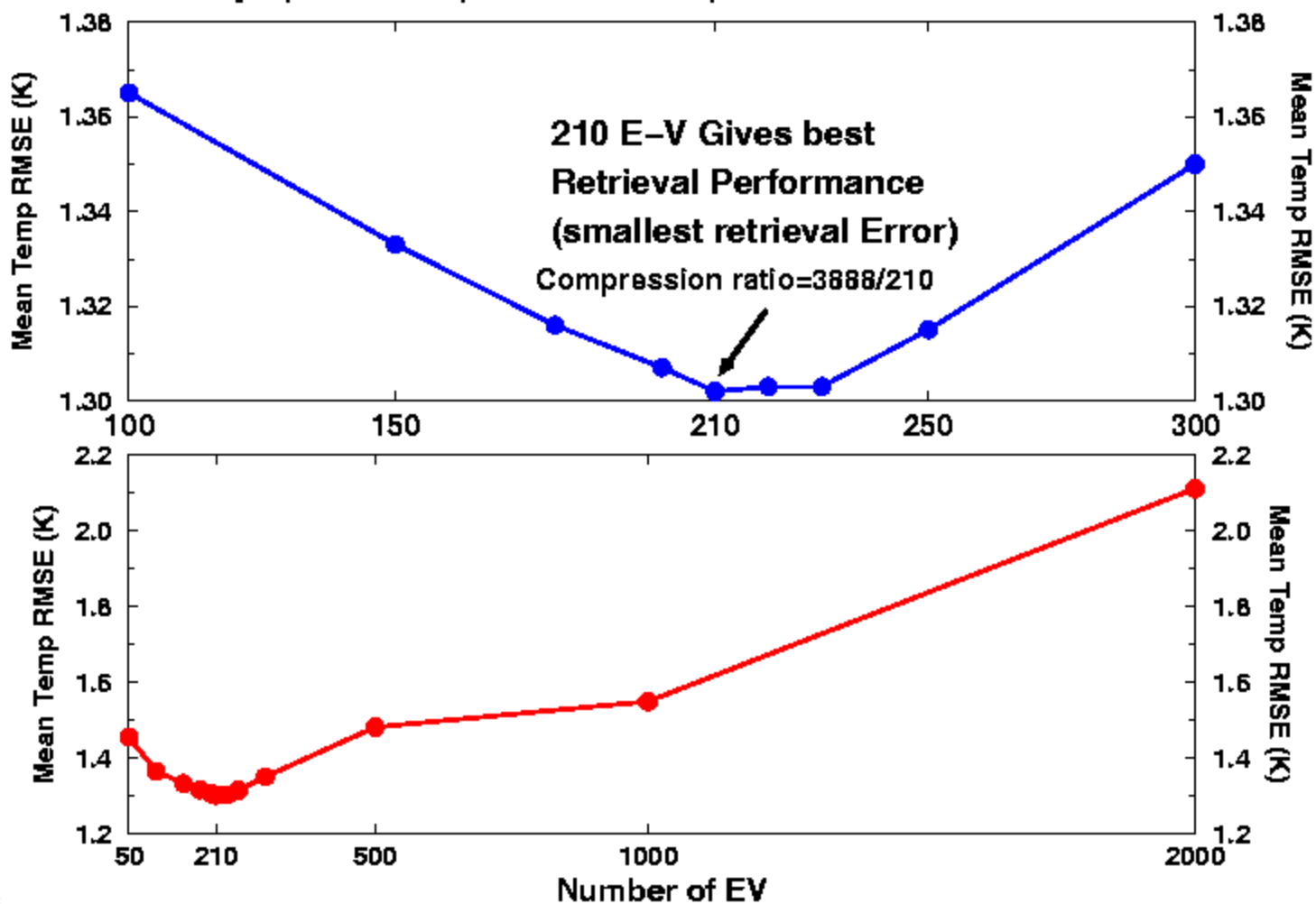
# GIFTS Compression/Retrieval Analysis

Noise Free EV (NFEV) Vs. Noisy EV (NEV)



## GIFTS Data Compression Retrieval Error

Only Optimal Compression Can Improve Retrieval Performance



# HPC On-board Compression Processing Requirement

- Computational Requirements
  - PC Generation
    - Mean :  $2008 \times (41+1) = 84336$  flops = 0.08 Mflops
    - COV : for  $150 \times 41 \times 2$  &  $448 \times 41$  matrix ->  
 $1.88 \times 2 + 16.7$  Mflops = 20.5 Mflops
    - SVD :  $9.4 \times 2 + 244$  Mflops -> 262.8 Mflops
  - PC Compression
    - $[630 \times (20+1) + 150 \times (20+1) \times 2 + 448 \times (20+1)] \times 16384$  ->  
474 Mflops
  - Total =  $0.08 + 20.5 + 262.8 + 474 = 757$  Mflops





# HPC On-Board Compression Processing Requirement

- Memory Requirements

- PC Coefficients

- Mean :  $2008 * 16 = 0.03$  Mbytes
    - COV :  $(630 * 630 * 16 * 2) + (150 * 150 * 16 * 2) + (448 * 448 * 16) = 16.62$  Mbytes
    - PCs :  $2 * (20 * 630 * 16) + 2 * (20 * 150 * 16) + (20 * 448 * 16) = 0.64$  Mbytes

- Interferograms

- Training :  $41 * 2048 * 32 = 2.7$  Mbytes
    - Cube data :  $16384 * 2048 * 32 = 1073$  Mbytes

- Total = 1093 Mbytes

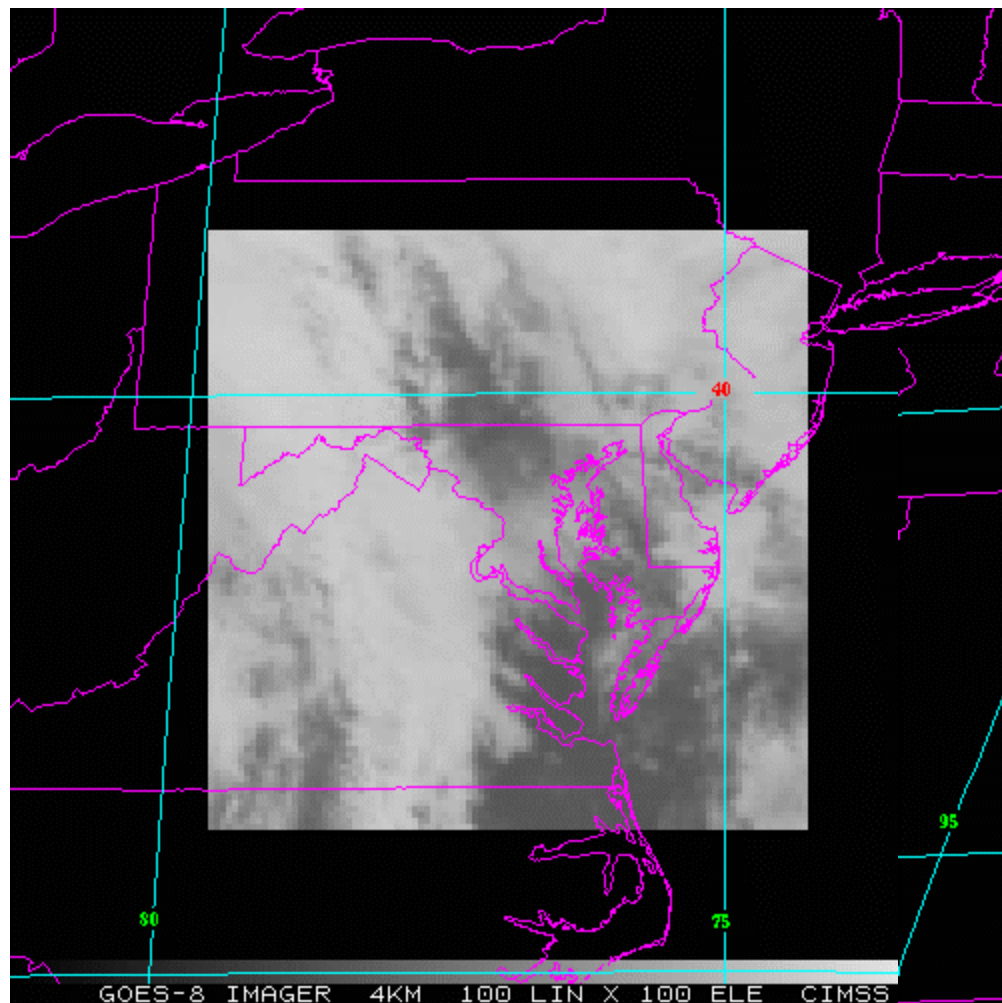


# Onboard Computing Requirements

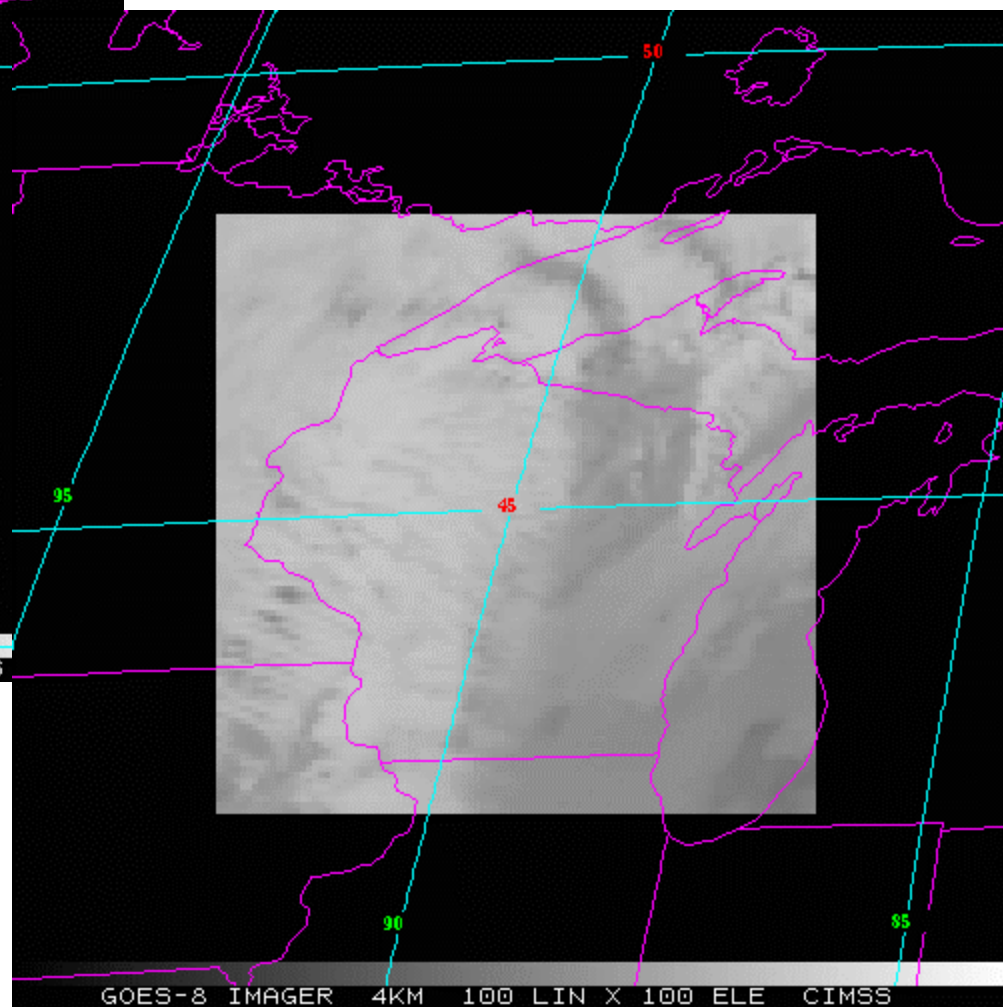
- **Calibration**
  - $4N + N\log_2(N)$  order calculation per interferogram
  - 15 ops per point LW; 16 ops per point S/MW
- **Resampling** from self-apodized state
  - $59N + 9N\log_2(N)$  order calculation per interferogram
  - 158 ops per point LW; 167 ops per point S/MW
  - can be mitigated by pre-interpolating raw interferograms before filtering
- **Compression** by Principal Component Analysis
  - $M*N$  order calculation per interferogram for  $M$  PCs
  - $M=100$  implies 100 ops per point



# Potential DPC Processing Domain



**DC**

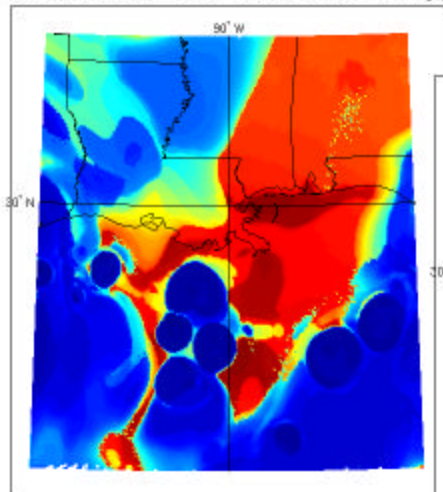


**Madison**

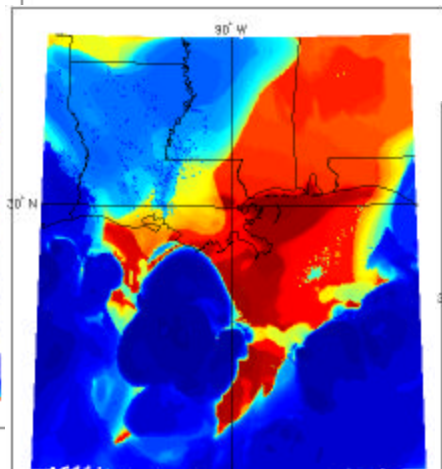


# Potential ABS Dataset for Compression Study

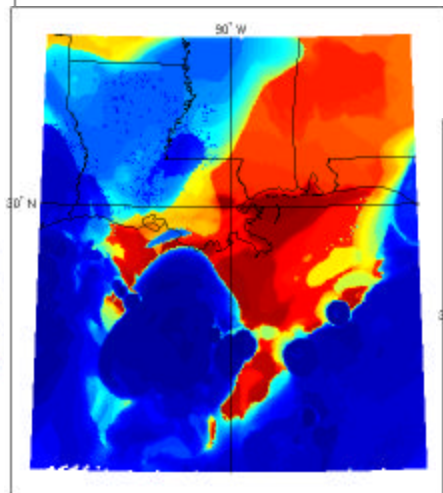
Radiances ( $\text{mW/m}^2 \text{ sr cm}^{-1}$ ) at  $900.3402 \text{ 1/cm}$  [1]



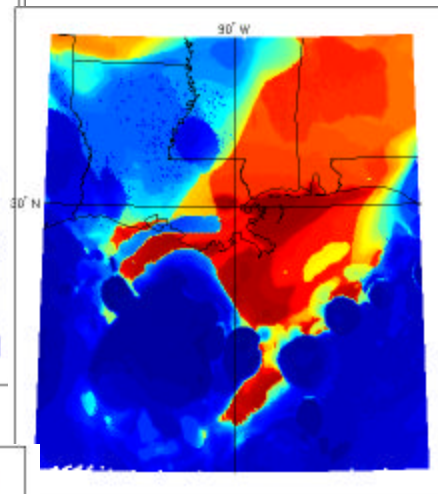
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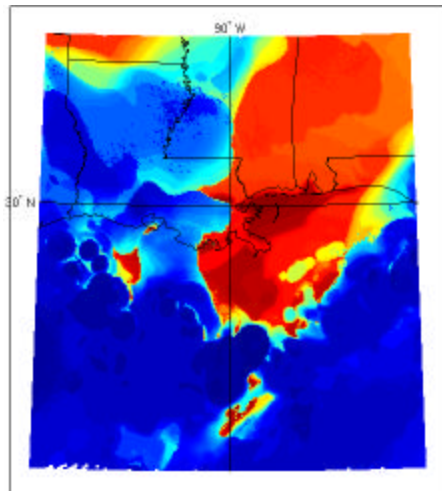
00:30Z



01:00Z



01:30Z



02:00Z

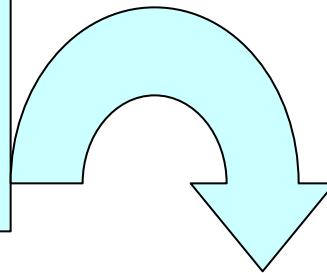
2:30Z



# Implementation Roadmap for ABS Hyperspectral Data Compressing

## Measurement Simulation:

Atmospheric Condition Modeling  
TOA Radiance Modeling  
Instrument Effect Modeling  
Calibration Modeling



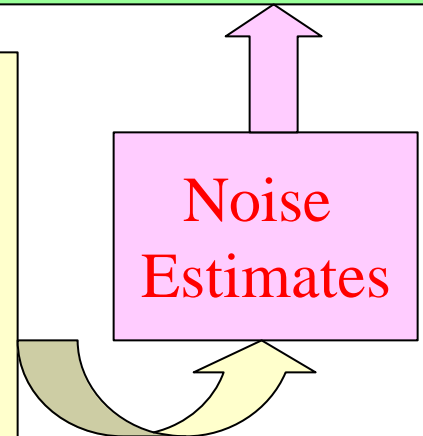
## Processing Implementation:

On-Board  
Ground-Based  
Validation

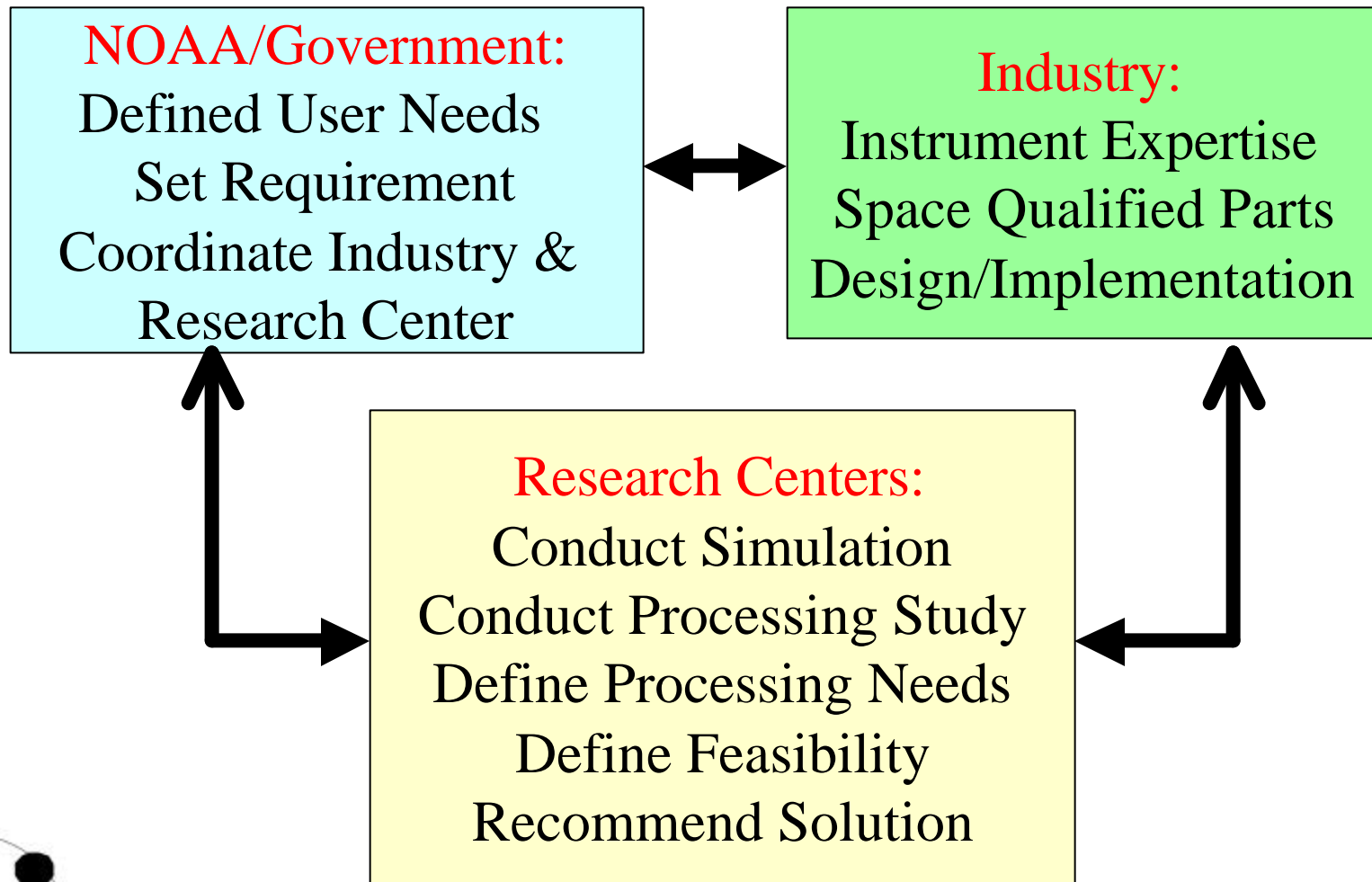
## Data Compression Study:

Raw/Calibrated Spectral Domain  
Raw/Calibrated Spatial Domain  
Dependent/Independent Domain  
PC/EOF/SVD Transformation Approach  
Wavelets Transformation Approach  
Quantization/Coding  
On-board/Ground-Based

Noise  
Estimates



# Responsibility Roadmap for ABS Data Compressing



# Roadmap for ABS Data Compressing Study

## **1. Leveraging of NASA GIFTS on-board compression work**

**1-1. Processing Algorithm - Continue to optimize  
DPCC approach**

**1-2. Processing Requirements - Refine requirement  
for ABS efficient ground-based and on-board  
compression**

**1-3. Measurement/Products Impacts - Reconfirm  
compression impacts on both level-1 and level-2  
data**



# Roadmap for ABS Data Compressing Study - continue

## **2. Adapting GIFTS Compression work with Enhancement/Improvement**

**2-1. Test enhancement of numerical method of  
deriving DPCC used in GIFTS experiment**

**2-2. Test variety of similar (non-PC) numerical  
techniques and inter-compare their respective  
performance and efficiency**

## **3. Comparing Image and Spectral Compression Technique**

**3-1. Compare product impact of image (I.e. JPG  
2000) and interferogram/spectral domain  
compression**





# Roadmap for ABS Data Compressing Study - continue

## **4. Modeling ABS Instrument Measurements**

**4-1. Develop ABS specific radiative transfer model**

**4-2. Model ABS instrument outputs - both signal & noise**

**4-3. Simulate ABS geo-orbital high temporal and spatially coherent measurements using high spatial resolution numerical model output and/or data cubes from field experiments**

**4-4. Modeling ABS pre-processing and calibration procedure**

**4-5. Provide ABS raw interferogram and calibrated spectral images**



# Roadmap for ABS Data Compressing Study - continue

**5. Define Tradeoff Disadvantages/Benefits for  
“Lossless” and Lossy” Compression Approaches**

**6. Extended ABS compression study – use not only the  
data transformation based compression approach and  
to include all other compression components**

**6-1. Data quantization**

**6-2. Data coding and decoding**

**7. Define Performance for both Ground-based and  
On-board Compression**

**8. Make Recommendations for ABS Operational  
Consideration for Data Downlink and Ground Data  
Redistribution**

